# Optimized online filter stack spectrometer for ultrashort X-ray pulses\*

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Currently, with the advent of high-repetition-rate laser-plasma experiments, the demand for online diagnosis for the X-ray spectrum is increasing because the laser-plasma-generated X-ray spectrum is very important for characterizing electron dynamics and applications. In this study, scintillators and silicon PIN (P-type-Intrinsic-N-type semiconductor) diodes were used to construct a wideband online filter stack spectrometer. The X-ray sensor and filter arrangement was optimized using a genetic algorithm to minimize the condition number of the response matrix. Consequently, the unfolding error was significantly reduced based on numerical experiments. The detector responses were quantitatively calibrated by irradiating the scintillator and PIN diode with various nuclides and comparing the measured  $\gamma$ -ray peaks. A prototype 15-channel spectrometer was developed by integrating an X-ray detector with front- and back-end electronics. The prototype spectrometer could record X-ray pulse signals at a repetition rate of 1 kHz. Furthermore, an optimized spectrometer was employed to record the real-time spectra of laser-driven bremsstrahlung sources. This optimized spectrometer offers a compact solution for spectrum diagnostics of ultrashort X-ray pulses, exhibiting improved accuracy in terms of spectrum measurements and repetition rates, and could be widely used in next-generation high-repetition-rate high-power laser facilities.

Keywords: Filter stack spectrometer; Laser plasma diagnostics; X-ray diagnostics; Scintillator; PIN diode

#### I. INTRODUCTION

Laser-driven plasma-based electron accelerators and X3 ray sources powered by ultra-intense laser technology have
4 been extensively researched in recent years. With an ac5 celerating gradient of approximately 100 GeV/m in laser
6 plasma accelerators, electrons can be accelerated to hundreds
7 of MeV within a few millimeters [1]. Subsequently, these
8 electrons can generate X-rays through betatron radiation [2],
9 inverse Compton scattering [3–5], and bremsstrahlung [6],
10 thus providing tabletop alternatives to large-scale conventional accelerator-based X-ray sources. These X-ray sources
12 have advantages such as femtosecond duration, micron-sized
13 source dimensions, and a wide spectral range [7], thereby ex14 hibiting tremendous potential for multiple applications [8],
15 including biological radiography [9], non-destructive testing
16 [10, 11], and high-energy-density physics [12, 13].

The research and application of laser-driven tabletop X-ray sources require a unique set of diagnostics [14]. Among them, X-ray spectrometers are particularly important as they characterize electron dynamics in plasma [4, 5, 15, 16] and are useful in various applications [13]. Multiple types of spectrometers have been developed to cover a wide range of pho-

23 ton energies, from a few keV to tens of MeV, in laser-plasma 24 experiments. For X-rays below 30 keV, charge-coupled devices (CCDs) operating under single-photon counting mode 26 provide high-resolution X-ray spectra by identifying individ-27 ual X-ray photon signals in a single image frame [17, 18]. Crystal spectrometers can be employed for X-rays below 100 29 keV, and the spectrum can be measured by detecting the an-30 gular distribution of X-rays diffracted by the crystal [19, 20]. 31 For X-rays with energies in the range of hundreds of keV, 32 an electron-track-based spectrometer has been proposed that 33 reconstructs X-ray energies by detecting Compton electron 34 tracks and energies using silicon trackers [21]. For X-rays 35 greater than 1 MeV, the Compton spectrometer converts the X-rays into electrons via forward Compton scattering. Comp-37 ton electron spectra are measured using a magnetic spectrom-38 eter, from which X-ray spectra can be derived [22–26]. Al-39 though the aforementioned spectrometers are sensitive to X-40 rays within relatively narrow energy ranges, the filter stack 41 spectrometer (FSS) enables the diagnosis of X-ray spectra 42 over a wide band, typically ranging from tens of keV to hun-43 dreds of MeV. A FSS employs a stack of filters interlaced 44 with X-ray sensors [27–29], and the characteristic parame-45 ters of the X-ray spectra can be reconstructed from the re-46 sponse matrix (RM) and sensor signals. Additionally, FSSs 47 have the advantages of simple manufacturing and simple op-48 eration; therefore, they have been widely used in laser-plasma 49 experiments.

Currently, many FSSs utilize image plates (IPs) as X-ray sensors [27–29] because of their reusability, high sensitivity to X-rays, versatility, and resistance to electromagnetic pulses [30, 31]. However, the IP signals must be read offline using an

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55 ing. This offline readout time does not meet the requirements 113 X-ray sensors, front-end electronics (FEE), and the DAQ sys-56 of high-repetition-rate laser-plasma experiments. Given the 114 tem, resulting in a compact and user-friendly system. No-<sub>57</sub> importance of high repetition rates in studying experimental <sub>115</sub> tably, the proposed online FSS exhibits sensitivity to X-rays 58 laws and optimizing accelerators and X-ray sources [32–34], 116 ranging from tens of keV to hundreds of MeV, enabling the there is a need for online diagnosis of the wideband spectrum 117 recording of X-ray pulse signals at a repetition rate of 1 kHz. of laser-induced X-rays.

X-ray sensors [35]. Scintillators convert X-rays into visi- 120 proposed online FSS demonstrates an energy measurement 63 ble scintillation light, which can be easily transformed into 121 error of less than 1%, whereas traditional IP systems have electric signals using a photoelectric converter. In contrast, 122 a 20% energy measurement error [29], thereby providing a 65 semiconductors convert X-rays into charge carriers (electrons 123 more accurate unfolding spectrum. 66 and holes). Electric signals are generated at the electrode 67 as the charge carriers drift under a bias voltage. The de-68 cay time of scintillators and the charge carrier drift time of 69 semiconductors typically range from a few to hundreds of 70 nanoseconds. Therefore, electrical signals can be recorded 125 71 and processed online using an electric readout system. Con-72 sequently, an FSS constructed with scintillators or semicon-73 ductors would allow for a fast repetition rate, aligned with 127 linear system, which results in substantial errors in spectrum 74 the current state-of-the-art and next-generation laser systems. 128 measurements. Because the scintillator can function as both 75 Recently, online FSSs based on scintillators have been devel- 129 filter and sensor, parameters such as the layer thickness, num-76 oped [36-39] utilizing CCDs or complementary metal-oxide- 130 ber of layers, filter density, and scintillator density need to 77 semiconductor (CMOS) cameras as photoelectric converters. 131 be finely tuned to alleviate the ill-conditioned nature of the 78 Notably, scintillator-based FSSs have already been employed 132 RM. Rusby et al. [36] optimized their online FSS based 79 in experiments [40-42], demonstrating exceptional perfor- 133 on the difference in the scintillator output within the energy  $_{80}$  mance in wideband X/ $\gamma$ -ray detection. However, certain as-  $_{134}$  range of interest. The optimal scintillator should exhibit the 81 pects of the currently developed online FSS techniques re- 135 largest difference in scintillator output. However, this opti-82 quire further improvement.

84 of CCDs or CMOS cameras covers only a small solid angle. 138 efficiency. 85 This limitation can result in high statistical uncertainties, par- 139 quately optimized, resulting in a severely ill-conditioned RM. 144 be written as follows: These limitations may contribute to a relatively large error in 92 X-ray spectrum determination.

In this paper, we propose an optimized online fast X-ray 94 spectroscopy system (FSS) and present its implementation 95 herein. To address the ill-conditioned RM, we employed a 96 genetic algorithm [43] to optimize the sensor and filter arrangement. To achieve robust light coupling and a high light collection efficiency, we utilized PIN diodes with large sensitive areas and low noise as the photoelectric converters. Furthermore, PIN diodes were employed as sensors in the channels closest to the X-ray sources, enabling the direct detection of low-energy X-rays and improving the unfolding accuracy 152 111 a multi-channel data acquisition (DAQ) system based on the 161 calibration of the light yield and light collection efficiency

54 IP scanner, which takes approximately 10 min for data read- 112 DRS4 chip [44]. The proposed online FSS integrates filters, 118 By contrast, CCD- or CMOS-based FSSs typically have a Scintillators and semiconductors are commonly used in 119 maximum repetition rate of 100 Hz [36]. Furthermore, the

#### II. METHODOLOGY

# Spectrometer optimization

The most significant drawback of the FSS is the ill-posed mization criterion was spectrum-dependent and the scintilla-First, the light collection efficiency is low because the lens 137 tor thicknesses were kept constant, limiting the optimization

To propose a universal optimization method, we first es- $_{86}$  ticularly under conditions of low X-ray fluence. Second, the  $_{140}$  tablish a formal model for encoding an X-ray spectrum S(E)87 calibration and stability of the scintillation-light-collection ef- 141 into the experimental channel  $D_i$  for an N-channel FSS. The 88 ficiency pose challenges owing to the non-solid nature of light 142 mathematical definitions and notation employed in this study 89 couplings. Finally, the FSS configuration has not been ade- 143 are consistent with those used by Fehl et al. [45, 46].  $D_i$  can

$$D_{i} = \int_{0}^{E_{\text{MAX}}} R_{i}(E)S(E)dE + \epsilon_{i} = d_{i} + \epsilon_{i}(i = 1, ...N),$$
(1)

where  $D_i$  represents the experimental channel data,  $R_i(E)i = 1^N$  denotes the response function, di represents the noise-free channel data, and  $\epsilon_i$  represents uncertainties 149 and noise. Equation (1) can be expressed in vector-matrix 150 notation as follows:

$$\mathbf{D} = \mathbb{R}\mathbf{S} + \Delta\mathbf{D} = \mathbf{d} + \Delta\mathbf{D}.\tag{2}$$

The errors that affect the unfolding accuracy can be diwithin an energy range of tens to one hundred keV. The pro-  $_{153}$  vided into two parts. The first part is the perturbation  $\Delta \mathbf{D}$ posed configuration allows for direct calibration of the light- 154 superimposed on D during the data-gathering process, which collection efficiency and alleviates the ill-conditioned nature 155 includes factors such as statistical uncertainty, signal noise, of the RM. According to numerical experiments, the relative 156 digitization errors, and uncorrected signal baselines, among deviation of the true and unfolded spectra can be decreased 157 others. The second part is the bias between the experimen-108 to approximately 16%. The electrical signals from the PIN 158 tally measured or simulated RM and the actual RM, expressed 109 diodes are amplified using in-house built trans-impedance 159 as  $\mathbb{R} \to \mathbb{R} + \Delta \mathbb{R}$ . The presence of  $\Delta \mathbb{R}$  can be attributed to 110 amplifiers (TIAs) and main amplifiers, and then digitized by 160 drifts and uncertainties in the fitting parameters, such as the 163 [46], only  $\Delta \mathbf{D}$  is discussed here.

165 problem. Various unfolding algorithms can be employed to 222 scintillator thickness in layers 7–15. address this problem, including regularization methods, leastsquares spectrum adjustment, parameter estimation, iterative unfolding methods, and the maximum entropy principle [47]. However, these unfolding algorithms often struggle to provide mathematically rigorous or realistic estimates of the error propagation relationship between the spectral unfolding error  $\Delta S$  and the data perturbation  $\Delta D$ . Nevertheless, it is worth noting that the error propagation relationship between  $\Delta S$  and  $\Delta D$  is primarily determined via the response function  $\mathbb{R}$ . For instance, an upper-bound measure for  $\Delta \mathbf{S}$  can be estimated from  $\Delta \mathbf{D}$  and the condition number of the RM is denoted by  $cond(\mathbb{R})$ , as described in [45].

$$||\Delta \mathbf{S}||/||\mathbf{S}|| \le \operatorname{cond}(\mathbb{R})||\Delta \mathbf{D}||/||\mathbf{D}||,$$
 (3)

where  $||\mathbf{D}||=(\sum_{i=1}^N D_i^2)^{\frac{1}{2}}$  represents the norm of  $\mathbf{D}$ . RM  $\mathbb{R}$  can be either a square or non-square matrix [59], and the condition number  $cond(\mathbb{R})$  can be calculated via singular value decomposition. By reducing  $cond(\mathbb{R})$ , for example, by alleviating the ill-conditioned nature of the RM, the upperbound measure of  $\Delta S$  can be lowered, resulting in improved 185 precision in terms of the spectrum measurements. Furthermore,  $cond(\mathbb{R})$  is determined solely by the FSS configuration. Hence,  $cond(\mathbb{R})$  can serve as a measure of merit for FSS optimization, independent of the spectrum.

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Another challenge in spectrometer optimization is the 190 multi-parameter optimization problem. FSS typically comprises numerous filter and sensor layers, and the thickness and density (determined by the material) of each layer can 235 affect  $cond(\mathbb{R})$ . Consequently, multiple parameters must be optimized. Owing to the practical limitations on the layer thickness for both the filter and sensor, as well as the absence of derivatives and linearity in this problem, the genetic algorithm is a suitable method for optimization. 197

Several factors restrict the range of the optimization parameters. In an FSS, filters and sensors closer to the X-ray 241 source are typically thinner, whereas those farther away are thicker. This design ensures that most low-energy X-rays deposit their energy in the layers near the sources and highenergy X-rays do so in the layers farther away. Consequently, RM  $\mathbb{R}$  has a smaller condition number (cond( $\mathbb{R}$ )). To address can result in significant statistical errors, sensors with a 300  $\mu$ m depletion layer thickness, such as PIN diodes, were used 208 in the layers near the X-ray source. For custom production 209 convenience, the scintillators are made of Gd<sub>3</sub>Al<sub>2</sub>Ga<sub>3</sub>O<sub>12</sub> (GAGG) [48], while the filters are made of aluminum or copper. After determining the number of layers,  $cond(\mathbb{R})$  should 212 be minimized because it is scale-dependent. Considering that the number of layers is a tradeoff between the applicable en-214 ergy range and the complexity of the signal readout system, 215 15 layers were selected, including six PIN diodes and nine 216 scintillators. The overall configuration of the proposed online 217 FSS is listed in Table 1. The layer number represents the dis-218 tance from the X-ray source with the filter closer to the source 256

162 discussed in Sect. II C. Because  $(\Delta \mathbb{R})S$  is analogous to  $\Delta D$  219 in each layer. As an aluminum film of 50  $\mu$ m is always used 220 as the first layer for electromagnetic shielding, the parameters Solving Eq. (2) poses challenges because it is an ill-posed 221 to be optimized are the filter thickness in layers 2-15 and the

Table 1. General configuration of the proposed online FSS

Layer	Filter	Sensor	Layer	Filter	Sensor
1	Al	Si-PIN	9	Cu	GAGG
2	Al	Si-PIN	10	Cu	GAGG
3	Al	Si-PIN	11	Cu	GAGG
4	Al	Si-PIN	12	Cu	GAGG
5	Al	Si-PIN	13	Cu	GAGG
6	Al	Si-PIN	14	Cu	GAGG
7	Cu	GAGG	15	Cu	GAGG
8	Cu	<b>GAGG</b>			

A key aspect for implementing the genetic algorithm is 224 the fitness assignment method. As the population consists 225 of 2000 individuals and there are 300 iterations, approximately  $6 \times 10^5$  cond( $\mathbb{R}$ ) calculations, i.e., RM calculations, 227 are required. Accurately RM calculations using the Monte 228 Carlo method [28, 36, 37] consume significant computational 229 power. To reduce the computational power requirement, a 230 simplified RM calculation model that utilizes the X-ray mass 231 energy absorption coefficients and mass attenuation coeffi-232 cient is proposed. First, the expected energy deposition of  $_{233}$  a single X-ray with energy E in the i-th sensor, denoted by  $E_{\mathrm{dep},i}(E)$ , can be calculated as

$$E_{\text{dep},i}(E) = (1 - e^{-\mu_{en,i}(E)s_i}) \cdot \prod_{j=1}^{i-1} e^{-\mu_j(E)s_j} \cdot \prod_{j=1}^{i} e^{-\mu_j(E)f_j} E,$$
(4)

where  $\mu_{en,i}(E)$  represents the X-ray mass energy absorption coefficient of the *i*-th sensor,  $\mu_i(E)$  represents the X-ray mass 238 attenuation coefficient of the j-th sensor or filter, sj and fj 239 denote the thickness of the j-th sensor and filter, respectively. 240 Thus, the RM equation can be written as

$$R_i(E) = E_{\text{dep},i}(E) \cdot ESC_i. \tag{5}$$

where  $ESC_i$  are the energy-signal coefficients of the i-th 243 channel. For the PIN diode,

$$ESC_i = 1/3.62 \times q \times \rho_i, \tag{6}$$

the low light-collection efficiency of thin scintillators, which 245 where 3.62 eV is the pair creation energy of silicon [49], q is the elementary charge, and  $\rho$  is the gain of the electronics in 247 ohm. For GAGG,

$$ESC_i = (LY \times LCE \times QE)_i \times q \times \rho_i, \tag{7}$$

 $_{249}$  where LY is the light yield of GAGG, LCE is the light col- $_{250}$  lection efficiency, and QE is the quantum efficiency of the 251 photon detector. If we disregard the nonlinearity of the scin-252 tillator light yield and electronics,  $ESC_i$  becomes indepen- $_{253}$  dent of th X-ray energy E. Therefore, the practical response equation to be solved can be derived using Eqs. (1) and (5) as 255 follows:

$$\mathbf{D}/\mathbf{ESC} = \mathbb{E}_{dep} \mathbf{S_{unfold}}.$$
 (8)

258 notation of  $E_{\text{dep},i}(E)$ . An error  $\Delta S$  exists between  $S_{\text{unfold}}$  297 such as Compton scattering and pair production processes,  $_{259}$  and the real X-ray spectrum S owing to perturbation  $\Delta D$  in  $_{298}$  which become dominant in photon-matter interactions start-260 D. In Eq. (8),  $\mathbb{E}_{dep}$  is equivalent to RM  $\mathbb{R}$ , and can be deter-299 ing at hundreds of keV. Consequently, the simple RM calcumined from Eq. (4). Therefore, the optimization process for 300 lation model results deviate from the actual values above hunreducing  $\operatorname{cond}(\mathbb{E}_{\operatorname{dep}})$  is illustrated in Fig. 1.

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ter thicknesses and nine scintillator thicknesses. These thick- 305 unfolding error, as demonstrated next. nesses are represented as floating-point numbers and encoded as bit strings to create chromosomes. Each individual contained 24 binary chromosomes, representing the 14 filter 306 thicknesses and nine scintillator thicknesses. To consider practical layer thickness limitations, lower and upper limits 307 2 and 50 mm, respectively. Each binary chromosome uses 20 was also set to zero. The generation gap, mutation probabil- 312 simulate the channel data. ity, and crossover probability were set to 0.9, 0.01, and 0.7, 313 respectively. The termination criterion was reached when the 314 GEANT4 [51], a simulation platform using the Monte Carlo iteration time was 300.

iterations are shown in Fig. 2. The optimal  $\operatorname{Cond}(\mathbb{E}_{\operatorname{dep}})$  is  $_{317}$  PIN diode carrier board, collimator, shielding, and other me-281 approximately  $4 \times 10^4$ , which represents a significant reduc- 318 chanical parts. The incident X-rays were simulated as penciltion compared with the unoptimized online FSS configura- 319 like beams uniformly and randomly distributed within a 6tion. For instance, the previously reported CsI FSS [37] ex- 320 mm-diameter circle, matching the collimator diameter. The hibited a  $Cond(\mathbb{E}_{dep})$  of  $2 \times 10^{12}$  (considering 15 channels). <sub>321</sub> energy range of the incident X-rays was set from 10 keV The optimal configuration obtained during the iterations is 322 to 200 MeV. For each energy bin, the X-ray energies were listed in Table 2. The 0.01-mm precision is maintained, con- 323 uniformly and randomly sampled and 10<sup>7</sup> X-rays were simu-288 sidering that the machining tolerance of the GAGG crystal is 324 lated. The energy deposition curves of the X-ray beams im-289 0.02 mm.

Table 2. Optimized configuration of the proposed online FSS

Lover	Filter	Thickness	Sensor	Thickness
Layer		(mm)	Schson	(mm)
1	Al	0.05	Si-PIN	0.3
2	Al	0	Si-PIN	0.3
3	Al	0	Si-PIN	0.3
4	Al	2.82	Si-PIN	0.3
5	Al	9.95	Si-PIN	0.3
6	Al	24.34	Si-PIN	0.3
7	Cu	3.53	GAGG	2
8	Cu	10.07	GAGG	2
9	Cu	4.73	GAGG	4.44
10	Cu	6.97	GAGG	13.04
11	Cu	0.57	GAGG	12.15
12	Cu	13	GAGG	33.74
13	Cu	1.14	GAGG	21.65
14	Cu	18.24	GAGG	33.2
15	Cu	34.52	GAGG	50

It is worth noting that the optimization process using a simple RM calculation model has certain limitations. First, be- 345 292 cause the mass attenuation and mass X-ray absorption coeffi- 346 type GAGG crystals manufactured by EPIC CRYSTAL Co., cients are available only within an energy range of 1 keV to 20  $_{347}$  Ltd., with a light yield LY of 54000 photons/MeV were used  $^{294}$  MeV, the optimization process considers X-rays ranging from  $^{348}$  in this study. The light-collection efficiency LCE was ap-

where  $S_{unfold}$  is the spectral unfolding and  $\mathbb{E}_{dep}$  is the matrix  $_{296}$  RM calculation model does not consider secondary effects, 301 dreds of keV. However, it still provides a reasonable estima-The genetic algorithm was implemented using the Sheffield 302 tion of the actual RM, and we demonstrated that optimization 264 Genetic Algorithm toolbox [50]. The population consisted 303 is an effective approach for achieving a partially optimized of 2000 individuals, with each individual containing 14 fil- 304 structure. This is evident from the significant reduction in the

#### Unfolding spectrometer response

Numerical experiments were conducted to test the unfoldwere set for the filters and scintillators, 0.01 and 50 mm and 308 ing procedure and evaluate the accuracy of the unfolded radi-309 ation spectra. Using Eqs. (2) and (5), the expected energy debits to ensure sufficient precision. For the iterations, all filter  $_{310}$  position  $\mathbb{E}_{dep}$ , X-ray spectrum S, energy-signal coefficients thicknesses were set to zero, and any thickness below 0.1 mm  $_{311}$  ESC, and perturbation  $\Delta D$  were calculated and modeled to

First, the optimized online FSS was modeled using method, to obtain an accurate  $\mathbb{E}_{dep}$ . The simulation model The minimum and average  $\operatorname{Cond}(\mathbb{E}_{\operatorname{dep}})$  values during the 316 consists of the filters, sensors, scintillation photon detector, pinging on the online FSS, i.e.,  $\mathbb{E}_{dep}$ , are shown in Fig. 3.

The X-ray spectrum S is modeled as follows:

$$S(E) = S_{\text{Beta}}(E) + S_{\text{Brems}}(E) + S_{\text{BG}}(E), \qquad (9)$$

where  $S_{\mathrm{Beta}}(E) = A E^{\alpha} \exp(-\beta E)$  represents the on-axis betatron component,  $S_{\mathrm{Brems}} = \frac{B}{E}(\nu - \ln(E))$  represents the on-axis bremsstrahlung component, and  $S_{BG}(E) =$  $C\exp(-\eta E)$  represents the background component [28, 52]. Note that E is in MeV. Parameters A,  $\alpha$ ,  $\beta$ , B,  $\nu$ , C, and  $\eta$ define the shape of the curves and the fluence ratios of the three components. Specifically, they are set to 12.47, 0.768,  $7.52, 4.09 \times 10^{-4}, 3.88, 0.01, \text{ and } 1, \text{ respectively.}$  In this scenario, the betatron radiation critical and peak energies are 0.25 and 0.1 MeV, respectively, and the fluence ratio of the background component is 7%. This represents a typical betatron radiation spectrum with background [28]. Assuming X-ray energies ranging from 10 keV to 10 MeV and a total photon count of  $10^5$ , the simulated energy depositions in the online FSS channels were obtained by multiplying the ex-343 pected energy deposition  $\mathbb{E}_{ ext{dep}}$  by the photon count in each 344 energy bin, S(E)dE.

ESC can be estimated using Eqs.(6) and (7). GAGG-HL-10 keV to 10 MeV. Second, it is well known that the simple 349 proximately 60% under typical packaging and optical cou-

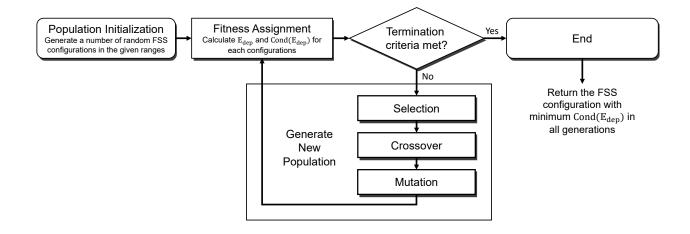


Fig. 1. Optimization process of the proposed online FSS using the genetic algorithm

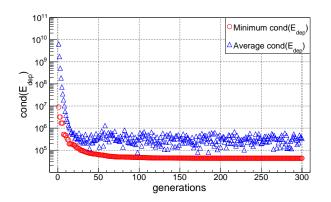


Fig. 2. (Color online) Evolution of  $\operatorname{Cond}(\mathbb{E}_{\operatorname{dep}})$  during the genetic algorithm iterations

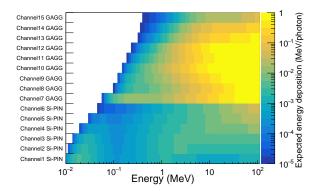


Fig. 3. (Color online) Response matrix expressed as  $\mathbb{E}_{dep}$  obtained via Monte Carlo simulations

351 for GAGG is approximately 530 nm [48], and the quantum 385 represents the noise-free channel data.

 $_{352}$  efficiency QE of PIN diodes, such as the 0.3-mm Si-PIN, 353 is approximately 90% at a wavelength of 530 nm. Because 354 ESC may vary owing to the different scintillators, packag-355 ing, and optical couplings, it was experimentally calibrated as described in Sect. II C. The FEE gains  $(\rho)$  are the product of the gains of the TIAs and main amplifiers, which collectively determine the overall gain of the electronic unit. The gains of the TIAs and main amplifiers were determined individually to ensure that the signal amplitudes conformed to the dynamic ranges of each stage. A detailed discussion of  $\rho$  is provided in Sect. III B and the values are listed in Table 4.

The perturbation  $\Delta \mathbf{D}$  is primarily caused by the statistical uncertainty  $\sigma(E)_{st}$ , where E represents the energy deposition in the detector, and the electronic noise  $\sigma_{noise}$ . The total perturbation  $\sigma_{total}$  is calculated as  $\sigma_{total} = \sqrt{\sigma(E)_{st}^2 + \sigma_{noise}^2}$ . The statistical uncertainty in the PIN diode channels can be estimated using  $\sigma(E)st = 2.355\sqrt{F \cdot E \cdot W}$ , where F =0.12 is the Fano factor and W=3.62 eV is the energy required for the formation of a charge carrier pair. Statistical 371 uncertainties in the GAGG channels were estimated based on a previous calibration experiment conducted in our laboratory using radioactive sources [53]. In particular,  $\sigma(E)_{st} =$  $_{\rm 374}~0.09\cdot 662\times 10^{3}\cdot \sqrt{\frac{662\times 10^{3}}{E}}.$  The electronic noise model is complex and beyond the scope of this study. The calculation method for the electronic noise in a high-speed waveformsampling detector is described in detail in [54]. According to Cang et al. [54], when the pulse amplitude fully utilizes the ADC range and the integration time window is 150 ns, the electronic noise reaches approximately 0.12%. Considering that our time integration window is 600 ns and the pulse am-382 plitude may vary from pulse to pulse, a 1% electronic noise 383 error estimation is reasonable. Therefore, an electronic noise <sub>350</sub> pling conditions [53]. The maximum emission wavelength <sub>384</sub> of  $\sigma_{noise} = 0.01 \times D_i$  is applied to all channels, where  $D_i$ 

Based on the simulated channel data,  $\mathbf{D}_{\mathrm{sim}}$ , the unfolded 387 X-ray spectrum was obtained by solving Eq. (8) using the <sup>388</sup> expectation-maximization method [55]. The convergence degree is indicated by the normalized mean absolute distance (MAD) between the fitting and simulated channel data.

$$MAD_{\text{data}} = \frac{1}{N} \sum \frac{|D_{i,\text{fit}} - D_{i,\text{sim}}|}{D_{i,\text{sim}}},$$
 (10)

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where N denotes the number of channels. Using a constant 393 function of unity as the initial guess for  $S_{\rm unfold}(E)dE$ , the fitting errors for different numbers of iterations are plotted in 395 Fig. 4(a). In the case of the optimized GAGG array (represented by the red open circles), the fitting error initially decreases rapidly to a low level within the first few steps and eventually reaches < 1% after 50 steps. The deviation between the unfolded spectrum and the spectrum model func-

$$MAD_{\text{spec}} = \frac{1}{M} \sum \frac{|S_{\text{unfold}}(E)dE - S(E)dE|}{S(E)dE}, \quad (11)$$

 $_{402}$  where M denotes the number of energy bins. As shown in 403 Fig. 4(b), the divergence can reach a minimum of approxi- $_{\rm 404}$  mately 16% in an energy range of 10 keV to 10 MeV when 405 the fitting converges. In this study, 100 iteration steps were 406 chosen, which is sufficiently large to observe the convergence 407 properties, obtain a reasonable spectrum shape, and fit the re-408 sponse of the FSS, as shown in Fig. 5. It should be noted 409 that the choice of the unfolding algorithm can significantly af-410 fect the unfolding results, and the expectation-maximization 411 method was selected because of its ability to avoid the need 412 for many additional constraints and its greater universality.

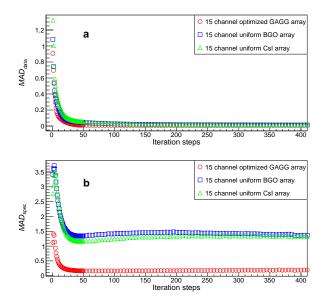


Fig. 4. (Color online) (a) Converge curve and (b) unfolding error for three kinds of online FSSs

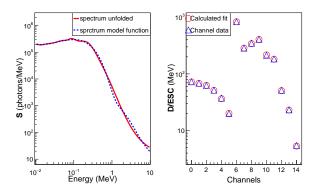


Fig. 5. (Color online) Fitting data (right) plotted with the corresponding spectra (left)

tion is also indicated by the normalized MAD between them. 415 al. [36] were also simulated following the aforementioned 416 procedure. The channel number and noise level were kept 417 the same as those in the GAGG array, that is, 15 channels. 418 The thickness of the BGO crystals was 0.2 cm. The condi-419 tion numbers for the CsI and BGO arrays were  $2 \times 10^{12}$  and  $_{420}$  1  $\times$  10<sup>12</sup>, respectively. The corresponding minimum fitting 421 errors were 115% for the CsI array and 133% for the BGO 422 array, respectively, as shown in Fig. 4. The unfolding er-423 ror of the optimized GAGG array was significantly reduced 424 compared to that of the CsI and BGO arrays with uniform 425 thickness.

#### Quantitative calibration of the spectrometer response

An accurate RM determination is of vital importance for precise spectrum unfolding. In Eq. (5),  $E_{\text{dep},i}(E)$  can be precisely obtained through Monte Carlo simulations [28, 36, 37]. However, ESC must be experimentally calibrated for scintillator channels because the light yield LY and light collection efficiency LCE can vary depending on the scintillators, packages, and optical couplings, making it challenging to model and calculate them.

The most challenging aspect of the experimental calibration campaign for LY and LCE is determining the energy deposition in the scintillators. Behm et al. [37] performed an experimental calibration by measuring the scintillation signal resulting from bremsstrahlung interactions. They theoretically calculated the bremsstrahlung X-ray beam in GEANT4 by simulating the collision of a typical electron beam with a 9-mm-thick piece of lead. The energy deposition in the CsI array was then determined using GEANT4. Rusby et al. [36] calibrated their online FSS by exposing the detector to radi-445 ation sources for an extended period of time and integrating 446 the camera images. Energy deposition during this period was also determined via GEANT4 simulation.

In the optimized online FSS, a PIN diode with a 0.3-mm 449 Si-PIN was also used as the scintillation photon detector. The 450 300-μm depletion layer of the 0.3-mm Si-PIN allows us to ob-For a comparative analysis, the CsI array proposed by  $_{451}$  tain  $LY \times LCE \times QE$  by comparing the full-energy peaks of Behm et al. [37] and the BGO array proposed by Rusby et 452 the radioactive sources. One source directly irradiates the PIN

454 scintillator [56]. The energy deposition in the scintillators, 490 tors are coupled with PIN diodes as photon detectors. The 455 that is, the gamma ray lines of the radioactive sources, can be 491 signal output pins of the PIN diodes are connected to an FEE 456 accurately determined, thereby providing more reliable cali-492 board. The following DAQ board provides the capability for bration results. 457

459 464 the experimental spectrum using a Gaussian curve superim- 500 electronics are housed in an enclosed copper and aluminum 466 the green lines; the background is represented by the brown 502 cludes only a 12-V power supply cable and a USB communi-467 lines.

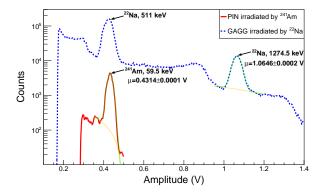


Fig. 6. (Color online) Spectra obtained during the calibration experiment for one channel

As the readout electronics are identical for GAGG and PIN 468 469 diodes, according to Eqs. (5)–(7),  $LY \times LCE \times QE$  can be 470 calculated as follows:

$$LY \times LCE \times QE = \frac{P_{\text{GAGG}}E_{\text{dep,PIN}}}{3.62[\text{eV}] \cdot P_{\text{PIN}}E_{\text{dep,GAGG}}}, \quad (12)$$

where  $P_{\rm GAGG}$  and  $P_{\rm PIN}$  are the fitting peak positions in the 508 The scintillators had front faces measuring 1 cm imes 1 cm experimental spectrum,  $E_{\rm dep,GAGG}$  and  $E_{\rm dep,PIN}$  are the energy depositions in GAGG and PIN diodes, which are 1274.5 and 59.5 keV, respectively. The corresponding spectra are  $_{\rm 476}$  shown in Fig. 6,  $P_{\rm GAGG}$  and  $P_{\rm PIN}$  are  $1.0646\pm0.0002$  and  $0.4314 \pm 0.0001$  V, respectively; therefore,  $LY \times LCE \times QE$  $_{478} = 31826 \pm 5$  electrons/MeV.

# III. IMPLEMENTATION

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aforementioned methods. A schematic of the online FSS pro- 520 (>98%) manufactured by 3M. The ESRs were cut into spetotype is shown in Fig. 7. Similar to classic radiation detec- 521 cific shapes to allow the coupling of the scintillation light tors [57], the FSS prototype comprises sensors, FEE, a DAQ 522 from the side of the scintillators. The scintillators were fixed system, and various software. The prototype comprises six 523 to an aluminum frame and interleaved with filters, as shown 485 PIN diode channels and nine GAGG scintillator channels as 524 in Fig. 8. 486 X-ray sensors, which are interleaved with aluminum and cop- 525 487 per filters. The collimator and laser sight are located in front 526 tors are irradiated by laser-induced brilliant X-ray pulses, for

453 diode 0.3-mm Si-PIN, while the other irradiates the GAGG 489 an outer collimator once the FSS is mounted. The scintilla-493 16-channel waveform digitization and communication. In ad-The calibration experiment utilized  $^{241}$ Am with a 59.5-keV  $_{494}$  dition, a power board supplies low-noise  $\pm 5$  V and 70 V line and <sup>22</sup>Na with a 1274.5-keV line. Charge-sensitive pre- 495 power to the FEE and PIN diodes. To avoid interference from amplifiers were used instead of TIAs to amplify the signals 496 scattered X-rays, the filters and X-ray sensors are shielded by induced by the radioactive sources. An example of the spec- 497 a 1-cm-thick lead layer and a 1-cm-diameter aperture allowtrum measured during the experiment for a single channel is 498 ing for X-ray incidence. The aperture is covered with a 50shown in Fig. 6. The peak positions were obtained by fitting 499 µm-thick aluminum foil for electromagnetic shielding. The posed on a second-order polynomial background, denoted by 501 box for electromagnetic shielding. The external interface in-503 cation cable.

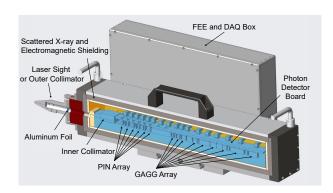


Fig. 7. (Color online) Cross-sectional view of the online FSS prototype

### Filter and sensor unit

GAGG scintillators were chosen because of their good 506 mechanical characteristics, non-hygroscopic properties, high <sub>507</sub> light yield (30–70 ph/keV), and fast decay times ( $\sim$ 100 ns). 509 with variable thicknesses. The filter and scintillator config-510 urations are listed in Table 3. The prototype configuration 511 was obtained using the original version of our optimization 512 code without proper constraints on the thickness, resulting in a configuration different from that listed in Table 2. Neverthe-514 less, the condition number of the prototype response matrix 515 is  $6 \times 10^5$ , which is close to the optimized condition number presented in Sect. II A (compared with the uniform-thickness configuration), and an improved performance is expected.

The reflection layers of the scintillators are enhanced spec-An online FSS prototype was built and calibrated using the 519 ular reflectors (ESRs), 65-µm polymers with high reflectance

The scintillation light output is bright when the scintilla-488 of the PIN diode sensors, and the laser sight is replaced with 527 example,  $>5 \times 10^7$  scintillation photons (10<sup>3</sup> MeV  $\times$  54000

Table 3. Configuration of the online FSS prototype

Layer	Filter	Thickness	Conson	Thickness
		(mm)	Sensor	(mm)
1	Al	0.05	Si-PIN	0.3
2	Al	0.59	Si-PIN	0.3
3	Al	0	Si-PIN	0.3
4	Cu	0.11	Si-PIN	0.3
5	Al	0	Si-PIN	0.3
6	Al	5.5	Si-PIN	0.3
7	Cu	45.55	GAGG	2.6
8	Cu	2.63	GAGG	4.85
9	Cu	1.3	GAGG	8.67
10	Cu	11.59	GAGG	8.58
11	Cu	2.52	GAGG	23.26
12	Cu	2.06	GAGG	14.26
13	Cu	12.94	GAGG	9.49
14	Cu	3.16	GAGG	31.23
15	Cu	4.91	GAGG	19.58



Fig. 8. (Color online) Filters and scintillators used in the prototype

photons/MeV) per channel per pulse. A non-multiplying photon detector is suitable for collecting scintillation light. To 530 improve the light-collection efficiency and coupling stability, a PIN diode with a large sensitive area (1 cm  $\times$  1 cm) was <sup>548</sup> used as the photon detector, and the PIN diodes were directly coupled with the scintillators using optical grease. As there 534 are six PIN diode channels used as X-ray sensors, all PIN diodes are mounted on one PIN diode carrier board vertically 536 or horizontally, as shown in Fig. 9.

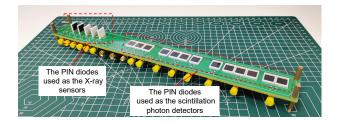


Fig. 9. (Color online) PIN diodes and their carrier board

The sensors, filters, and PIN diodes were placed in an X-538 ray- and electromagnetic-shielding enclosure along with the collimator and laser sight, making up the filter and sensor 568 unit, as shown in Fig. 10. Bias voltages and electric signals were applied or elicited using coaxial cables.

 $_{543}$  LY  $\times$  LCE  $\times$  QE values for the nine GAGG scintillation  $_{572}$  Butterworth low-pass filter (LPF) with a 40-MHz -3 dB band-544 channels were calibrated experimentally, as shown in Fig. 11. 573 width [58]. The transient response of the GAGG scintillator 545 Error bars are not visible in this figure because of the low peak 574 can be expressed as a single exponential decay signal with 546 fitting error.

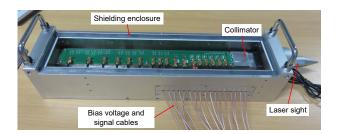


Fig. 10. (Color online) Filter and sensor unit

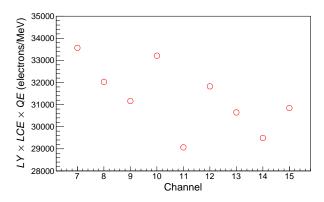


Fig. 11. Experimentally calibrated  $LY \times LCE \times QE$  for the nine GAGG scintillation channels of the prototype

## **Electronics unit**

The PIN diode signal is fed to a TIA via alternating cur-549 rent (AC) coupling, and a standard high-speed amplifier with 550 a 1.6-GHz gain bandwidth product is adopted as the TIA amplifier. A 2000-ohm resistor connects the cathode of the PIN diode to the ground, serving as the direct-current (DC) path, which can limit the current of the PIN diode and increase the 554 system reliability. The TIA is followed by the main amplifier, which adjusts the voltage amplitude to match the dynamic range of the DAQ system. In addition to the 16-channel TIAs and main amplifiers, the FEE board includes a trigger circuit to generate an inner trigger signal for the DAQ system.

The FEE circuit gains are determined to ensure that the signal amplitude is within the dynamic range of each circuit stage. First, the energy deposition per pulse in the PIN diodes and scintillators was calculated using GEANT4. The spectrum of the X-ray source was modeled using Eq. (9) with a photon fluence of  $1 \times 10^{11}$  photons/sr/pulse, and is located 1 m away from the collimator of the online FSS. Therefore, the number of X-ray photons passing through the collimating aperture is  $2.8 \times 10^6$  per pulse.

The temporal waveforms were calculated using the transient response model, which includes the GAGG scintillation 570 light, PIN diode output current, and output voltage of each Using the calibration method described in Section IIC, the 571 circuit stage. The PIN diode was treated as a second-order 575 a decay time of 100 ns, and the TIA can also be treated as

578 bandwidth product,  $R_{\rm F}$  is the feedback resistance, and  $C_{\rm D}$  614 GAGG decay time is 100 ns, a 1.024- $\mu$ s acquisition window  $_{579}$  is the input capacitance of the TIA.  $C_{\rm D}$  is mainly attributed  $_{615}$  is sufficient to capture the complete waveform. The online capacitance of the cables, and is in the order of ~100 pF. 617 kHz. However, the DAQ data transfer rate imposes a limita-584 the transient response model is plotted along with the exper- 621 in which higher repetition rates may be available, upgrading 585 imental waveform measured in the laser-plasma experiment, 622 the data transfer protocol would allow for a faster online FSS shown in Fig. 12. The simulated waveform is in good 623 system. agreement with the experimental waveform, e.g., the relative difference in the peak amplitudes is less than 2% when the integrals from 130 to 700 ns are equal (with the same energy de- 624 positions), thus validating the transient response model built 592 in this study.

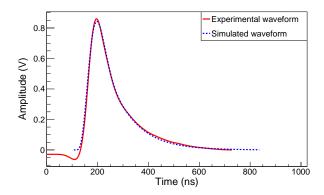


Fig. 12. (Color online) Simulated and experimental waveforms of the FEE output

As the voltage output swing of the TIA is 0–3 V and the 593 594 input dynamic range of the DAQ system is 1 V, the main amplifier gains are determined to fully utilize the dynamic range of the DAQ system, which is 0.32. Then, using the transient response model, the TIA gains are determined to ensure that the peak amplitudes of the 15-channel TIA outputs are in the order of 500 mV. The results are presented in Table 4, with the TIA and main amplifier gains listed on the left and right sides of the multiplication signs, respectively. The main purpose of this section is to describe the hardware design. As the 603 X-ray fluence can vary significantly in different laser-plasma 604 experiments, the FEE is designed as a plug-in module so that 605 the gains can be determined using the described methods and 606 can be easily changed.

Table 4. FEE gains				
Channels	1–6	7–12	13–15	
$\rho$ in ohm	100×0.32	200×0.32	1000×0.32	

To preserve the temporal waveform information and enable 651 608 flexible digital signal processing, a commercial 16-channel 652 using an electron spectrometer. The electron beam traversed 609 high-speed analog-to-digital conversion module based on 653 a 300-μm-thick beryllium vacuum window, with the elec-610 DRS4 chips was adopted as the DAO system. The DAO sys- 654 tron spectrometer positioned downstream of the vacuum win-611 tem provides a 1-GHz sample rate, a 1024-sample acquisition 655 dow. The measured electron spectra are shown in Fig. 14.

576 a second-order Butterworth LPF with a -3 dB bandwidth of 612 window (equivalent to 1.024 μs at 1 GHz), and a 30-MB/s  $\sqrt{GBP/(2\pi R_{\rm F}C_{\rm D})}$  [53], where GBP is the 1.6-GHz gain 613 transfer rate (using the USB 2.0 protocol). Given that the the terminal capacitance of the PIN diodes and the stray 616 FSS system requires a high repetition rate of several hundred The main amplifier was designed as an inverting second-order 618 tion of approximately 1 kHz, calculated as 30 MB/s divided voltage-controlled voltage source LPF with a 10-MHz -3 dB 619 by "16 channels × 12 bits/sample × 1024 samples/chanbandwidth. The simulated FEE output waveform obtained by 620 nel/pulse," resulting in 1220 pulses/s. In future campaigns

#### **BREMSSTRAHLUNG EXPERIMENT**

To test the functionality of the online FSS design, the pro-626 totype was implemented in a laser-driven bremsstrahlung experiment to facilitate the diagnosis of the  $X/\gamma$ -ray spectrum. Laser-driven bremsstrahlung offers several advantages, including high energy, micro-spot size, and a compact system scale, thereby leading to a significant improvement in the resolution of high-energy computed tomography (CT) [61]. These bremsstrahlung sources typically operate at high repetition rates. Real-time monitoring of the spectrum plays a vital role in evaluating the stability of the radiation source and aids in CT image reconstruction.

The experiment was conducted utilizing a high-repetition laser system with a 100-TW power, as shown in Fig. 13. During the experiment, a laser pulse was focused onto the gas chamber to generate high-energy low-emittance electron beams via a laser wakefield acceleration (LWFA) mechanism. The laser beam was focused onto a 25- $\mu$ m spot using an off-642 axis parabolic mirror with a 2-m focal length, which captured approximately 58% of the laser energy. By reducing the pulse duration to as short as 24 fs, a peak intensity of approximately  $_{\text{645}}$   $4.4 \times 10^{18} \; W/cm^2$  was achieved at the target point with an 646 energy input of 2 J. A 4-mm-long gas chamber served as 647 the target for generating the electron beams. Pure nitrogen 648 was used to enhance the plasma density and increase the total 649 charge via ionized injection. The molecular density reached <sub>650</sub> approximately  $1.4 \times 10^{19}$  cm<sup>-3</sup> at a pressure of 1000 kPa.

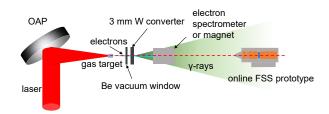


Fig. 13. (Color online) Bremsstrahlung experimental setup

First, the LWFA electron beam properties were assessed

656 The LWFA electron beam exhibited a divergence of approx-657 imately 7 mrad and charge of approximately 1000 pC. The energy of the electron beam ranged from 5 to 150 MeV.

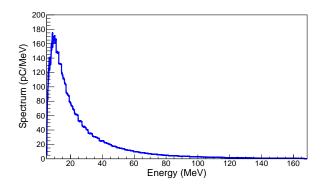


Fig. 14. Spectrum of the LWFA electron beam

Subsequently, the electron spectrometer was dismounted, 660 and a 3-mm tungsten converter was positioned 25 cm from the gas target to generate intense bremsstrahlung radiation. To deflect the transmission electrons, a 10-cm magnet with a magnetic field strength of 0.8 Tesla was placed behind the converter. The online FSS, situated at a distance of 1.2 m from the tungsten converter, was responsible for detecting 666 the on-axis bremsstrahlung spectrum. The waveform mea-667 surements from a single shot are presented in Fig. 15. For the GAGG channels, the waveforms were integrated over a 669 time window of 100—700 ns, while for the PIN diode chan-670 nels, integration was performed for 100-250 ns. These inte-671 grated waveforms constituted the experimental channel data 672 and are denoted by D. There are also some pulse-shaping  $_{673}$  methods that can be used to calculate  ${f D}$  if the X-ray sources 674 have a very high repetition rate and the waveforms accumu-675 late [62, 63]. The expected energy deposition ( $\mathbb{E}_{dep}$ ) was 676 obtained via Geant4 simulation and the energy-signal coef-677 ficients (ESC) were derived and computed using Eqs. (6) and (7). The spectra were obtained by solving Eq. (8) via the expectation-maximization method with 100 iteration steps.

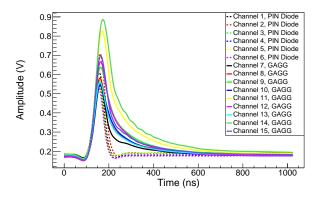


Fig. 15. (Color online) Measured waveforms

681 0.1 Hz, and the real-time responses of the online FSS were 720 the unfolding accuracy across energy bands ranging from tens

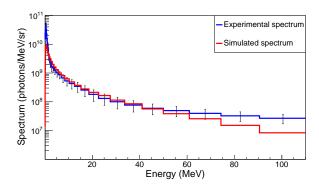


Fig. 16. (Color online) Spectra unfolded in the preliminary experiment

shots exhibiting suitable pulse amplitudes was selected for 684 subsequent unfolding to obtain the bremsstrahlung spectra. The average bremsstrahlung spectrum and its standard devi-686 ation for the five shots are depicted by the blue line in Fig. 687 16. In addition, the bremsstrahlung spectrum was simulated 688 using GEANT4. In the simulation,  $5 \times 10^9$  electrons were in-689 jected into a 3-mm tungsten converter with the electron spec-690 tral shape shown in Fig. 14. The on-axis bremsstrahlung within the acceptance angle of the online FSS (approximately  $_{692}$   $10^{-5}$  rad) was recorded. The simulated bremsstrahlung spec-693 trum is depicted by the red line in Fig. 16. The experimental 694 spectrum exhibits good agreement with the simulated spec-695 trum, particularly in the energy range of 1—80 MeV. The in-696 cident electrons in the simulation possess a total charge of 697 800 pC, which is consistent with the charge measured us-698 ing the electron spectrometer. It is worth noting that the 699 bremsstrahlung spectrum from a thick converter is challeng-700 ing to model using analytical formulas owing to the signif-701 icant bremsstrahlung absorption by the converter itself [64]. Consequently, the parameter-fitting unfolding techniques employed in previous studies [28, 29, 40] are not applicable to this particular bremsstrahlung. However, by enhancing the 705 FSS structure design and improving the data acquisition accu-706 racy, the expectation-maximization method can be employed 707 to unfold the spectrum with higher precision. The recon-708 structed photon flux reduction caused by self-absorption be-709 low 1 MeV matched well and was consistent with the sim-710 ulated spectrum. Nevertheless, a notable discrepancy exists 711 between the simulation and experimental results at approx-712 imately 1 MeV. This discrepancy may be attributed to the 713 presence of scattered background in the experiment, which 714 was not considered in the Geant4 simulation.

## V. CONCLUSION

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In this paper, we propose an optimization method that uti-717 lizes a genetic algorithm to address the ill-posed nature of the 718 FSS system. The condition number of the response matrix The bremsstrahlung was generated at a repetition rate of 719 (RM) is employed as the optimization criterion. To enhance 682 recorded. From the collected waveforms, a subset of five 721 of keV to tens of MeV, we employed high-density GAGG

722 scintillators and silicon PIN diodes. Monte Carlo simula- 744 bremsstrahlung spectrum was recorded in real time and ex-725 typical spectra within this energy range.

727 lation photon detectors was successfully implemented. This 749 ing accuracy. Additionally, we will investigate methodolo-<sub>795</sub> line FSS prototype operates at a repetition rate of 1 kHz with <sub>757</sub> effective online FSS technique is promising for advancing 796 the potential for further enhancement by increasing the data 758 laser-plasma research and application. transfer rate of the DAQ card, e.g., using an 80-MB/s optical link interface or a USB 3.0 interface. By eliminating the need for an image plate (IP) scanner or a high-speed CCD/C-MOS, the proposed online FSS system offers the advantages of cost-effectiveness and compactness.

The functionality of the online FSS prototype was vali- 760 <sub>743</sub> dated through a laser-driven bremsstrahlung experiment. The <sub>761</sub> assistance in the experiments.

723 tion results demonstrated that the optimized FSS configura- 745 hibited good agreement with the simulated bremsstrahlung 724 tion yielded significantly improved accuracy when measuring 746 spectrum. In future work, we will conduct additional sys-747 tem test experiments and enhance the electromagnetic com-The optimized online FSS featuring PIN diodes as scintil- 748 patibility to develop a low-noise system with high unfoldchoice enhances the light-collection efficiency and ensures 750 gies for identifying improved FSS structures by leveraging stable coupling, further improving the unfolding accuracy. In 751 supercomputers for Monte Carlo RM calculations and optiaddition, the use of PIN diodes facilitates the quantitative cal- 752 mizing parameters such as the number of layers. These inibration of light yields and light collection efficiencies. The 753 vestigations will be conducted with the aim of satisfying the electrical signals from the PIN diodes were amplified and dig- 754 accuracy requirements associated with diverse experimental itized using a custom front-end electronics (FEE) module and 755 scenarios. As the demand for high repetition rates and accua commercial data acquisition (DAQ) card. The current on- 756 racy increases, this optimized, integrated, compact, and cost-

# ACKNOWLEDGEMENT

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